Psychological consequences of long COVID: comparing trajectories of depressive and anxiety symptoms before and after contracting SARS-CoV-2 between matched long and short COVID groups

Daisy Fancourt^{1*}, Andrew Steptoe¹, Feifei Bu¹

¹ Department of Behavioural Science and Health, university College London, UK

^{*} Corresponding author: Daisy Fancourt, 1-19 Torrington Place, London, UK WC1E 7HB, d.fancourt@ucl.ac.uk

Psychological consequences of long COVID: comparing trajectories of depressive and anxiety symptoms before and after contracting SARS-CoV-2 between matched long and short COVID groups

Abstract

Background: There is a growing global awareness of the psychological consequences of long COVID, supported by emerging empirical evidence. However, the emergence and long-term trajectories of psychological symptoms following the infection are still unclear.

Aims: To examine when psychological symptoms first emerge following the infection with SARS-CoV-2, and the long-term trajectories of psychological symptoms comparing long and short COVID groups.

Methods: We analysed longitudinal data from the UCL COVID-19 Social Study (March 2020-November 2021). We included data from adults living in England who reported contracting SARS-CoV-2 by November 2021 (N=3,115). Of these, 15.9% reported having had long COVID (N=495). They were matched to participants who had short COVID using propensity score matching on a variety of demographic, socioeconomic and health covariates (N=962, n=13,325) and data were further analysed using growth curve modelling.

Results: Depressive and anxiety symptoms increased immediately following the onset of infection in both long and short COVID groups. But the long COVID group had substantially greater initial increases in depressive symptoms and heightened levels over 22 months follow-up. Initial increases in anxiety were not significantly different between groups, but only the short COVID group experienced an improvement in anxiety over follow-up, leading to widening differences between groups.

Conclusions: The findings support work on the psychobiological pathways involved in the development of psychological symptoms relating to long COVID. The results highlight the need for monitoring of mental health and provision of adequate support to be interwoven with diagnosis and treatment of the physical consequences of long COVID.

Keywords: long COVID, pandemic, mental health, depression, anxiety

Introduction

Long COVID (defined as the continuation of symptoms that develop during or after acute infection with SARS-CoV-2 that cannot be explained by an alternative diagnosis¹) is estimated to affect around 10% of people 12 weeks after initial infection, with substantial numbers sustaining symptoms over six months.² Long COVID can involve multi-organ complications including affecting the heart, brain, spleen, liver, blood vessels, gastrointestinal tract, kidneys, pancreas, and lungs.³ These complications involve multiple overlapping disease mechanisms,⁴ and are manifested as a wide range of physiological symptoms (e.g. fatigue, headache, dyspnea, muscle pain, cardiac abnormalities and anosmia) and neurological symptoms (e.g. sleep disturbances, problems concentrating, cognitive impairment).³,⁵ However, less well researched are the psychological symptoms associated with long COVID.

Infection with SARS-CoV-2 is, in itself, associated with psychological consequences, including depression, anxiety, stress and adjustment disorders, poorer sleep, increased substance use, and increased use of antidepressants and opioids.^{4,6,7} Whilst psychological symptoms generally improve over time, some can linger for substantial periods of time (such as 1 year) without much improvement, or can even worsen over time.^{8,9} When focusing specifically on long COVID, a meta-analysis of 39 studies including over 10,000 people found that 19% of people with long COVID reported anxiety and 8% depression as one of their symptoms.¹⁰ But results from individual studies in some countries have reported much higher prevalence (e.g. 42% for anxiety and 41% for low mood in a UK study)², and anxiety and depression are listed on the UK's official NHS long COVID symptom list.¹¹ However, whilst research is highlighting that psychological symptoms can be a feature of long COVID, a number of questions remain to be answered.

First, when do psychological symptoms of anxiety and depression first emerge in long COVID patients? Mechanistically, the ability of coronaviruses (including SARS-CoV-2) to directly infect the central nervous system (CNS) and cause neuroinflammation and consequential psychiatric symptoms is well reported.^{3,6} Similarly, SARS-CoV-2 has been found to affect the permeability of the blood-brain barrier, facilitating the entry of peripheral inflammatory cytokines to the CNS, further increasing neuroinflammation.^{12,13} Systemic inflammation as a result of immune-inflammatory dysregulation as a result of SARS-CoV-2 infection has also been shown to contribute to psychiatric and cognitive symptoms in patients.¹⁴ So it is plausible that heightened anxiety and depression could be experienced soon after SARS-CoV-2 infection. However, increased social isolation due to long COVID symptoms and anxiety related to persistent symptoms could mean that psychological

symptoms in fact emerge and increase during and beyond the acute state of infection amongst long COVID patients.^{15,16}

Second, does the level of psychological symptoms during the acute stage of SARS-CoV-2 infection differ amongst people who will go on to have short COVID vs long COVID? A relationship between the severity of immune-inflammatory dysregulation in patients with SARS-CoV-2 infection and depressive symptoms 3 months later has been reported,¹⁷ as has a relationship between neuro-immune inflammation and long COVID.¹⁸ As such, it is possible that initial psychological experiences around the onset of infection could predict an individual's risk of developing long COVID. But, reciprocally, heightened stress, anxiety and low mood at the onset of illness could itself adversely affect an individual's recovery from SARS-CoV-2 through increasing or prolonging disruption of neuro-endocrine and neuro-inflammatory processes.¹⁹ This has been demonstrated both through studies showing bidirectional associations between psychological symptoms and neuro-endo-immune processes as well as genetic studies highlighting pleiotropy between depression and inflammatory processes, suggesting a shared genetic vulnerability that could help explain the relationship between a history of mood disorders and long COVID noted in prior studies.¹⁴

Third, what are the longer-term trajectories of psychological symptoms amongst people with long COVID beyond the acute stage of infection? To date, much research on this topic has been limited by relatively short-term follow-up (typically of just a few months) and involved limited waves of data collection during that follow-up. Finer-grained data showing trajectories of psychological symptoms over time are still lacking. It is possible that following the acute stage of infection, some of the initial symptoms of psychological distress decline, as can happen for patients with short COVID.²⁰ However, it is also plausible that the reverse is true: the process of dealing with debilitating ongoing symptoms could exacerbate psychological distress.

Therefore, this study aimed to explore the mental health trajectories of people experiencing long COVID, compared to those with short COVID using data from the UCL COVID-19 Social Study. To ensure that any potential differences were not due to imbalances between long and short COVID patients in socio-demographic factors, histories of mental and physical health prior to infection, or symptoms of COVID-19 during acute infection, we used propensity score matching (PSM) to construct two balanced groups of long vs short COVID patients. Further, to differentiate experiences post-COVID from usual mental health experiences during the pandemic, we used growth curve models accounting for lockdowns, other social restrictions, and time of the year, tracking individuals

in the 10 months prior to their infection with SARS-CoV-2 and for 22 months of follow-up. This study therefore presents one of the largest and longest studies to date of the psychological experiences of patients with long COVID.

Methods

Data

Data were derived from the University College London (UCL) COVID-19 Social Study (CSS); a large panel study of the psychological and social experiences of over 75,000 adults (aged 18+) in the UK during the COVID-19 pandemic. The study commenced on 21 March 2020 and involved weekly and then monthly (August 2020 to November 2021) online data collection during the pandemic. Participants were recruited via convenience sampling and targeted recruitment of underrepresented/vulnerable groups. The study was approved by the UCL Research Ethics Committee [12467/005] and all participants gave written informed consent. Detailed information on the study is available online at https://osf.io/jm8ra/.

This study used data from participants living in England who completed the special module on COVID-19 experience in November 2021 (N=22 528). Of these, 4,938 participants (22%) reported having had COVID-19 by November 2021. We excluded participants (i) with missing data on COVID-19 specific measures (1%), (ii) who reported infection with SARS-CoV-2 before 21st March 2020 when the study was launched (see Supplementary Figure S1), and (iii) who reported having COVID-19 more than once due to the ambiguity in identifying long COVID-19 dates. This left us with a COVID-19 sample of 3,115 participants (see Figure S2 for sample selection).

Measures

COVID and Long COVID

In November 2021, the CSS included a special module on COVID-19 experience. Participants were asked 'overall, do you believe you have ever had COVID-19?' The response options included: (1) yes, confirmed by a positive COVID-19 test; (2) yes, confirmed by a positive antibody test; (3) yes, suspected by a doctor but not tested; (4) yes, my own suspicions; (5) No, not that I know of. Due to challenges in diagnosis of COVID-19, (e.g. prior to mass testing being available, due to test shortages and access challenges, and due to testing inaccuracies), definitions of long COVID do not require having had a positive test result, but rather the presence of symptoms that were initially

suggestive of COVID-19.²¹ So we considered both positive tests and suspected cases (category 1 to 4) as having had COVID-19. The information on date of contract was also collected: 'If you have had COVID-19, when did you first contract it?' Moreover, participants were asked if they considered themselves to have or have had long COVID, with responses: (1) yes, a medical professional has formally diagnosed me with long COVID; (2) yes, I have not been formally diagnosed but consider myself to have Long COVID; (3) no, I do not consider myself to have Long COVID; (4) I am unsure. This was recoded into a binary variable (yes/no) with unsure being treated as not having COVID.

Mental health outcomes

Depressive symptoms were measured using the Patient Health Questionnaire (PHQ-9),²² a standardised instrument for screening for depression in primary care. The questionnaire includes 9 items with 4-point responses with total scores ranging 0-27. Scores of 0-4 suggest minimal depression, 5-9 mild depression, 10-14 moderate depression, 15-19 moderately severe depression, and 20-27 severe depression.²² We used the total score as a continuous measure.

Anxiety symptoms were measured using the Generalized Anxiety Disorder assessment (GAD-7),²³ a well-validated tool used to screen for generalized anxiety disorder in clinical practice and research. The GAD-7 comprises 7 items with 4-point responses with total scores ranging 0-21. Scores of 0-4 are thought to represent minimal anxiety, 5-9 are thought to represent mild anxiety, 10-14 moderate anxiety, and 15 and above severe.²³ Again, the total score was used as a continuous measure.

Time

To examine mental health growth trajectories, a key variable is time. The time variable was constructed as month since people contracted SARS-CoV-2 (time 0), which took negative values for the period before infection (-21 to 21). It was calculated based on the self-reported contraction date and system-generated survey date (see Figure S3 for its distribution). This is relative time as the starting point (and end point) varied across individuals. We controlled for the month (absolute time) in which people contracted SARS-CoV-2 considering an individual's mental health is subject to the impact of time-related contextual factors (e.g. lockdowns and other restrictions). This was used as a series of dummy variables.

Covariates

To construct comparable groups (via propensity score matching), a range of factors were taken into account in our analyses. These included gender (women vs men), ethnicity (white vs ethnic minorities), age groups (age 18-29, 30-45, 46-59, 60+), education (up to GCSE levels, A-levels or

equivalent, and university degree or above), income (<£16,000, £16,000-29,000, £30,000-59,000, £60-89,000, ≥£90,000 per annum), employment status (employed non-key worker, employed key worker, other), area of living (city, town, rural), living situation (living alone, living with adults only, living with children), number of close friends (0 to 10+) and usual social contacts (twice a month or less, once or twice a week, three times a week or more), self-reported diagnosis of any long-term physical health condition or any disability (yes vs no), and self-reported diagnosis of any long-term mental health condition (yes vs no). All above measures were taken from the study baseline when participants joined the study for the first time. Moreover, we included baseline depressive (PHQ-9) and anxiety (GAD-7) symptoms when participants joined the study. Finally, we included a few COVID-19 specific measures, including month when participants had COVID-19 and whether confirmed by a test (COVID-19/antibody test vs doctor's/own suspicion). In addition, we considered self-reported severity of symptoms in the first one to two weeks (severe symptoms vs minor/asymptomatic).

Statistical Analysis

We employed propensity score matching (PSM) to construct two comparable groups: short COVID versus long COVID. The propensity score is the probability of being exposed to or having long COVID based on the observed covariates, which is used to pair participants with short COVID and long COVID. The two matched groups should have identical or similar distribution of covariates that are used to estimate the propensity score. We used one-to-one nearest neighbour matching within a calliper (a quarter of one standard deviation of the sample estimated propensity scores) without replacement. PSM was implemented using Stata psmatch2 command.

To compare mental health growth trajectories between the two matched groups, data were analysed using growth curve models. It allowed us to estimate the inter-individual heterogeneity in intra-individual changes over time. The model included a quadratic time term to allow for non-linear trajectories (see the Supplement for mathematic equations). As sensitivity analyses, (i) we reran the analyses using alternative matching methods, namely one-to-many nearest neighbour matching and kernel matching; (ii) we excluded anyone who said they were 'unsure' if they had long COVID; and (iii) we explored further people's understanding of the term 'long COVID'. If individuals reported believing they had long COVID but subsequently indicated that their symptoms had got better after 2 weeks, they were excluded, as were individuals who reported not having long COVID but who

said they had symptoms lasting more than 4 weeks. The main analysis based on one-to-one matching were unweighted; whereas growth curve models based on one-to-many or kernel matching were weighted using weights of matched controls generated by psmatch2. Analyses were carried out using Stata version 17.

Results

Sample Characteristics

Of the 3,115 participants considered for matching, 495 (15.9%) reported having had long COVID-19. After matching, 481 participants were successfully matched with a control. There was a considerable reduction of individual covariates imbalance after matching (Figure S4 and S5). In total, there were 13,325 observations from 962 participants (13.9 per person).

Sample characteristics by the two matched groups are reported in Table S2 (see Table S1 for PSM results). 78.2% of participants in the long COVID-19 group were women. Although women were found to be at a higher risk of long COVID-19 ²⁴, it is more than likely that there was an overrepresentation of women in the sample. However, weights were not applied due to a lack of credible information on the demographic characteristics of people who had long COVID in England. Among those with long COVID (N=481), 23.3% of them were formally diagnosed by a medical professional and 76.7% self-diagnosed (Table S3). Both groups experienced a comparable range of symptoms from being asymptomatic to being hospitalised (Table S3).

Growth Trajectories

We initially fitted the growth curve model allowing Long COVID grouping variable to be associated growth rate of the quadratic term. However, there was no evidence supporting this. Therefore, it was removed from the final model.

In the 10 months before contracting COVID-19 there was no evidence that the two COVID-19 groups differed in either the intercept or growth rate of depressive symptoms (Table 1 & Figure 1). However, at the time of infection, people who went on to develop long COVID-19 had 1.3 points higher depressive symptoms on the PHQ-9 (16% higher) than those with short COVID-19. This equated to an increase of 35% in depressive symptoms from the month before they contracted SARS-CoV-2 in the long COVID group vs an increase of 18% in the short COVID group and was independent of all covariates that were included in the PSM model, including initial symptom severity. Over time, there was no evidence that these two groups differed in the growth rate ("Long COVID*time"

variable, Table 1), but levels of depressive symptoms remained higher in the Long COVID group ("Long COVID" variable, Table 1) (Figure S6a additionally shows 95% confidence intervals).

[Table 1 here]

[Table 2 here]

[Figure 1 here]

As for anxiety, in the 10 months before contracting COVID-19 there was no evidence that the two COVID-19 groups differed in either the intercept or growth rate of anxiety symptoms (Table 2 & Figure 1). At the time of infection, people who went on to develop long COVID were slightly higher in their anxiety levels to those who had short COVID (0.52 points higher anxiety symptoms on the GAD-7; 8.9% higher), but this was not a significant difference ("Long COVID" variable, Table 2). This equated to an increase of 15% in depressive symptoms from the month before they contracted SARS-CoV-2 in the long COVID group vs an increase of 13% in the short COVID group. However, over time, anxiety symptoms of the long COVID group were less likely to decrease compared with those with short COVID, with an increasing discrepancy in anxiety symptoms by 22 months follow-up (35% higher in the long COVID group) ("Long COVID*time" variable, Table 2) (Figure S6b additionally shows 95% confidence intervals).

Sensitivity Analyses

Sensitivity analyses using one-to-many nearest neighbour matching and kernel matching yielded less balanced matches. Further, there was a significant difference in growth factors of depressive and anxiety symptoms between the two matched groups before contracting with COVID-19. The results from the one-to-many nearest neighbour matching are presented in Figure S7 and S8 in the Supplementary Material. Figure S9 shows the predicted growth trajectories by COVID-19 group from kernel matching. Good matches were achieved but results were materially unaffected when applying a more rigorous definition of long COVID (Figure S10) or when excluding people who were unsure about whether they had long COVID or not (Figure S11).

Discussion

This study examined the mental health trajectories of people who had long COVID-19, compared with those who had short COVID-19. Infection with SARS-CoV-2 was associated with significant increases immediately following the onset of infection in depressive and anxiety symptoms in both

groups. In the long COVID group, there was evidence that depression levels rose significantly higher than the short COVID group following onset of COVID-19, but anxiety levels were not significantly different between groups. Over time, the long COVID group maintained heightened levels of depression symptoms compared to the short COVID group, and for anxiety the long COVID group did not experience the improvements in anxiety seen in the short COVID group, leading to widening differences in mental distress between the two groups.

This study supports work on the mechanisms at play in the development of long COVID. First, symptoms of depression and anxiety emerge quickly following the onset of SARS-CoV-2 infection, with the peak in both symptoms occurring at the first measurement timepoint post-infection (i.e. within 1 week of reported infection). This points to immediate psychobiological pathways being implicated in the aetiology of COVID-related mental distress both in long and short COVID. Existing literature proposes that inflammatory mechanisms could be at play, ^{3,6} but it is also possible that fear related to contracting the virus could also exacerbate mental distress, especially since levels of worries about catching SARS-CoV-2 and potentially becoming seriously ill from it have been associated with heightened anxiety and depression across the pandemic. Whilst our study included participants who had a range of symptom experiences from hospitalisation to symptoms being mild or even asymptomatic, all participants in the study either knew (via testing) or suspected that they had SARS-CoV-2. We were unable to ascertain whether the reported increases in anxiety and depression found here were primarily driven by biological processes or psychological processes (i.e. fear of the virus) as we lacked data on psychological experiences in people with SARS-CoV-2 who were asymptomatic and did not know they had the virus.

Second, even when long and short COVID patients were matched on physical and psychiatric comorbidities prior to COVID and levels of SARS-CoV-2 symptom severity and even though they displayed similar trajectories of anxiety and depressive symptoms in the 10 months prior to infection, those in the long COVID group experienced greater increases in depressive symptoms immediately following the onset of SARS-CoV-2 infection. This complements previous work suggesting that the ability of SARS-CoV-2 to raise levels of systemic and neuro-inflammation may be greater in patients with long COVID and also suggests that whether an individual is likely to experience long COVID is decided early on in their experience of the virus. 17,18 Notably, there was not a significant difference in initial increases in anxiety levels between the two groups, which would support theories that the increase in depressive symptoms amongst long COVID patients is biologically driven by the virus rather than a manifestation of a greater predisposition to emotional distress during illness.

However, despite the larger initial increase in depressive symptoms in long COVID patients, both long COVID and short COVID groups experienced parallel decreases in symptoms over time (even within one month of contracting SARS-CoV-2, despite long COVID patients citing their physical symptoms persisting beyond this). This could suggest a process of psychological recovery, even potentially whilst experiencing ongoing physiological symptoms. However, we did not ask participants about how their symptoms and functioning at follow-up compared to when their virus started. So some of this improvement in depressive symptoms amongst long COVID patients could be illustrative of an improvement in long COVID itself (potentially mirroring reductions in levels of inflammation), whilst for patients who continued to experience physiological symptoms, this psychological recovery may not have been felt. Further, despite some improvement, levels of depressive symptoms remained higher in the long COVID group across the entire 22-month followup than in the 10 months prior to infection, whereas the short COVID group returned to baseline or below baseline levels within 4 months. So any apparent recovery was not complete. Relatedly, levels of anxiety did not improve over time in long COVID patients over the follow-up, with an increasing discrepancy compared to short COVID patients. The evident persistence of mental distress in long COVID patients mirrors findings from previous studies of patients experiencing other coronaviruses. For example, patients who developed SARS-CoV ("SARS") in 2003-2004 reported persistent stress one year later without signs of decrease, even if physical symptoms had improved.²⁵ But it may not simply be a case of initial anxiety symptoms experienced during acute infection (whether initially biologically or psychologically driven) persisting, but also a consequence of new psychological challenges relating to the realisation that one's initial infection is becoming long COVID and the associated psychological, social and behavioural consequences of ongoing illness (e.g. challenges accessing treatments, threat's to one's identity and uncertainty about the future). 15,16 Notably, whilst there was a slight increase in depressive symptoms in both groups towards the end of the followup, the confidence intervals widened across the follow-up period as numbers of people who had contracted SARS-CoV-2 early enough in the pandemic to be followed-up 22 months later decreased. So this increase is likely a feature of the sample rather than a common pattern amongst both groups over time.

Our findings highlight that for patients with long COVID, psychological symptoms could persist for as long as 2 years post-infection, with clear consequences the treatment of long COVID patients. Barriers to diagnosis with long COVID and subsequent challenges navigating and accessing treatments can in itself exacerbate long COVID symptoms.¹⁶ Given the well-established

interconnection between psychological and inflammatory processes, these additional treatmentrelated stressors could contribute to the prolonging of long COVID symptoms. So it is important that patients feel listened to, validated, and supported in their diagnosis and treatment. 16 There has been a call for long COVID public health response to include personalised treatment and rehabilitation and multidisciplinary care.²⁶ Our findings support this call, and further suggest that (i) clinicians should be aware of the possibility for depression, anxiety and other psychiatric symptoms in patients with long COVID and recognise that such symptoms may not just be a consequence of ongoing physical symptoms but may have been primary outcomes from the initial SARS-CoV-2 infection; (ii) neuropsychological evaluations for patients who are experiencing long COVID could be valuable to determine whether specialised mental health support is also required, and such evaluations should not assume a resolution of psychological symptoms in the absence of treatment; and (iii) psychological support should be provided as part of multidisciplinary care and, given the early onset of psychological symptoms, early provision of such for patients suspected of having long COVID should be recommended. In some countries such as the UK, it has been recommended that mental health problems alongside or as a result of long COVID can be managed by following existing relevant guidelines.³ However, we recommend that any mental health support needs to be provided alongside (rather than as a substitute for) broader medical investigation and support for long COVID, given diagnosis of psychiatric symptoms without adequate attention to other symptoms has been found to be detrimental to mental health in patients with long COVID.²⁷ Finally, informal mental health support for patients experiencing long COVID such as peer support groups and community social and cultural activities via schemes such as social prescribing should be encouraged as evidence is already suggesting that the broader support and validation of experiences from others can assist in recovery. 16

A main strength of this study lies in repeated monthly follow-ups of the same participant over 22 months since March 2020, allowing the longest and most detailed follow-up to date on psychological experiences of long COVID patients. By using propensity score matching, we were able to reduce the observed differences between long and short COVID groups to render them comparable. We achieved a good quality match, which resulted in equivalent mental health scores in the months prior to infection, improving the comparability of post-infection mental health changes between people with short and long COVID. However, we cannot rule out the possibility of potential biases due to unobserved covariates that are associated with the risk of having long COVID-19 (despite the wide range of covariates included in our models). Moreover, whilst our sample showed good

heterogeneity in initial severity of SARS-CoV-2 symptoms and subsequent long COVID experiences, our sample may not be representative of the population who had (long) COVID, especially as those with more severe ongoing long COVID symptoms may have been more likely to drop out of the study. We followed current best practice in epidemiological research in how we defined long COVID. But some of our patients lacked formal diagnoses, so it is possible that some participants' symptoms were caused by alternative illnesses. Additionally, our sample was relatively heterogeneous in terms of long COVID experiences, with a range of different patterns of symptoms reported, from persistent acute symptoms for months, to relapsing-remitting symptoms, to low-level persistent symptoms. Whilst this heterogeneity is typical in the diagnosis category of "long COVID", future research could consider whether there are differential psychological experiences depending on pattern of long COVID symptoms. Finally, our sample relied on participants' self-report of the date they contracted SARS-CoV-2. This could have been affected by recall bias. So whilst we found an increase in psychological symptoms immediately following reported onset of infection, this increase may have lagged by a few days. Nonetheless, this relatively short lag time does not undermine the conclusions or proposed mechanisms.

Overall, this study presents the longest and most detailed data on psychological experiences of long COVID patients to date, answering crucial questions. Psychological symptoms of anxiety and depression emerge quickly following onset of SARS-CoV-2 in long COVID patients, with levels of depression rising significantly above levels in patients who go on to experience short COVID. Over the following two years, whilst there is some decrease in depressive symptoms, they remain above pre-infection levels, whilst anxiety levels show little signs of improvement. This presents a contrast to short COVID patients where levels return to below-infection levels within 4 months of infection. The findings shed light on the psychobiological pathways involved in the development of psychological symptoms relating to long COVID as well as suggesting that initial psychological experiences during SARS-CoV-2 infection could be explored further as potential predictors of subsequent risk of developing long COVID. The results also show that we cannot assume a gradual organic recovery from the psychological effects of long COVID, highlighting the need for monitoring of mental health and provision of adequate support to be interwoven with diagnosis and treatment of the physical consequences of long COVID.

Declarations

Ethics approval and consent to participate

The COVID-19 Social Study was approved by the UCL Research Ethics Committee [12467/005] and all participants gave written informed consent.

Availability of data and materials

Anonymous data will be made publicly available following the end of the pandemic.

Declaration of Interest:

None

Funding

This COVID-19 Social Study was funded by the Nuffield Foundation [WEL/FR-000022583], but the views expressed are those of the authors and not necessarily the Foundation. The study was also supported by the MARCH Mental Health Network funded by the Cross-Disciplinary Mental Health Network Plus initiative supported by UK Research and Innovation [ES/S002588/1], and by the Wellcome Trust [221400/Z/20/Z]. DF was funded by the Wellcome Trust [205407/Z/16/Z].

Author contributions

DF and AS developed the study idea. FB analysed the data. DF and FB wrote the first draft. All authors had accessed and verified the underlying data. All authors provided critical revisions, read and approved the submitted manuscript.

Acknowledgements

The researchers are grateful for the support of a number of organisations with their recruitment efforts including: the UKRI Mental Health Networks, Find Out Now, UCL BioResource, SEO Works, FieldworkHub, and Optimal Workshop. The study was also supported by HealthWise Wales, the Health and Care Research Wales initiative, which is led by Cardiff University in collaboration with SAIL, Swansea University.

References

- 1 Mahase E. Covid-19: What do we know about "long covid"? BMJ 2020; **370**. doi:10.1136/BMJ.M2815.
- ONS. Prevalence of ongoing symptoms following coronavirus (COVID-19) infection in the UK. 2022.https://www.ons.gov.uk/peoplepopulationandcommunity/healthandsocialcare/conditionsanddiseases/

- bulletins/prevalenceofongoingsymptomsfollowingcoronaviruscovid19infectionintheuk/6january2022 (accessed 18 Aug2022).
- 3 Crook H, Raza S, Nowell J, Young M, Edison P. Long covid—mechanisms, risk factors, and management. *BMJ* 2021; **374**. doi:10.1136/BMJ.N1648.
- 4 Xie Y, Xu E, Al-Aly Z. Risks of mental health outcomes in people with covid-19: cohort study. *BMJ* 2022; **376**. doi:10.1136/BMJ-2021-068993.
- Aiyegbusi OL, Hughes SE, Turner G, Rivera SC, McMullan C, Chandan JS *et al.* Symptoms, complications and management of long COVID: a review. *J R Soc Med* 2021; **114**: 428–442.
- Thye AYK, Law JWF, Tan LTH, Pusparajah P, Ser HL, Thurairajasingam S *et al.* Psychological Symptoms in COVID-19 Patients: Insights into Pathophysiology and Risk Factors of Long COVID-19. *Biology 2022, Vol 11, Page 61* 2022; **11**: 61.
- Fahriani M, Ilmawan M, Fajar JK, Maliga HA, Frediansyah A, Masyeni S *et al.* Persistence of long COVID symptoms in COVID-19 survivors worldwide and its potential pathogenesis A systematic review and meta-analysis. *Narra J* 2021; **1**. doi:10.52225/NARRAJ.V1I2.36.
- Huang L, Yao Q, Gu X, Wang Q, Ren L, Wang Y *et al.* 1-year outcomes in hospital survivors with COVID-19: a longitudinal cohort study. *The Lancet* 2021; **398**: 747–758.
- 9 Taquet M, Geddes JR, Husain M, Luciano S, Harrison PJ. 6-month neurological and psychiatric outcomes in 236 379 survivors of COVID-19: a retrospective cohort study using electronic health records. *The Lancet Psychiatry* 2021; **8**: 416–427.
- Michelen M, Manoharan L, Elkheir N, Cheng V, Dagens A, Hastie C *et al.* Characterising long COVID: a living systematic review. *BMJ Global Health* 2021; **6**: e005427.
- NHS. Long-term effects of coronavirus (long COVID). 2021.https://www.nhs.uk/conditions/coronavirus-covid-19/long-term-effects-of-coronavirus-long-covid/ (accessed 18 Aug2022).
- Yachou Y, el Idrissi A, Belapasov V, Ait Benali S. Neuroinvasion, neurotropic, and neuroinflammatory events of SARS-CoV-2: understanding the neurological manifestations in COVID-19 patients. *Neurological Sciences* 2020; **41**: 2657–2669.
- Troyer EA, Kohn JN, Hong S. Are we facing a crashing wave of neuropsychiatric sequelae of COVID-19?

 Neuropsychiatric symptoms and potential immunologic mechanisms. *Brain, Behavior, and Immunity* 2020; **87**: 34–39.
- Penninx BWJH. Psychiatric symptoms and cognitive impairment in "Long COVID": the relevance of immunopsychiatry. *World Psychiatry* 2021; **20**: 357.
- Cascella M, de Blasio E. Neurological, Psychological, and Cognitive Manifestations of Long-COVID. In: Cascella M, de Blasio E (eds). *Features and Management of Acute and Chronic Neuro-Covid*. Springer , 2022, pp 137–158.
- Burton A, Aughterson H, Fancourt D, Philip KE. 'I had no life. I was only existing'. Factors shaping the mental health and wellbeing of people experiencing long Covid: a qualitative study. *medRxiv* 2021; : 2021.10.13.21264855.
- Mazza MG, de Lorenzo R, Conte C, Poletti S, Vai B, Bollettini I *et al.* Anxiety and depression in COVID-19 survivors: Role of inflammatory and clinical predictors. *Brain, Behavior, and Immunity* 2020; **89**: 594–600.
- Yong SJ. Long COVID or post-COVID-19 syndrome: putative pathophysiology, risk factors, and treatments. Infectious Diseases 2021; **53**: 737–754.

- Steptoe A, Hamer M, Chida Y. The effects of acute psychological stress on circulating inflammatory factors in humans: A review and meta-analysis. *Brain, Behavior, and Immunity* 2007; **21**: 901–912.
- Bourmistrova NW, Solomon T, Braude P, Strawbridge R, Carter B. Long-term effects of COVID-19 on mental health: A systematic review. *Journal of Affective Disorders* 2022; **299**: 118–125.
- Nabavi N. Long covid: How to define it and how to manage it. *BMJ* 2020; **370**: m3489.
- Löwe B, Kroenke K, Herzog W, Gräfe K. Measuring depression outcome with a brief self-report instrument: sensitivity to change of the Patient Health Questionnaire (PHQ-9). *Journal of Affective Disorders* 2004; **81**: 61–66.
- Spitzer RL, Kroenke K, Williams JBW, Löwe B. A Brief Measure for Assessing Generalized Anxiety Disorder. *Archives of Internal Medicine* 2006; **166**: 1092.
- Bai F, Tomasoni D, Falcinella C, Barbanotti D, Castoldi R, Mulè G *et al.* Female gender is associated with long COVID syndrome: a prospective cohort study. *Clinical Microbiology and Infection* 2022; **28**: 611.e9-611.e16.
- Lee AM, Wong JGWS, McAlonan GM, Cheung V, Cheung C, Sham PC *et al.* Stress and psychological distress among SARS survivors 1 year after the outbreak. *Canadian Journal of Psychiatry* 2007; **52**: 233–240.
- 26 Alwan NA. The road to addressing Long Covid. *Science* (1979) 2021; **373**: 491–493.
- 27 Kingstone T, Taylor AK, O'Donnell CA, Atherton H, Blane DN, Chew-Graham CA. Finding the "right" GP: a qualitative study of the experiences of people with long-COVID. *BJGP Open* 2020; **4**: 1–12.

Tables and Figures

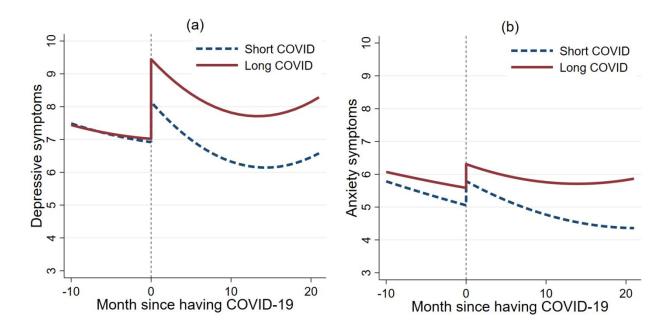


Figure 1. Predicted growth trajectories of depressive (a) and anxiety (b) symptoms from growth curve models

Table 1. Results from growth curve model on depressive symptoms

	Before having COVID-19			After having COVID-19			
	Coef.	SE	р	Coef.	SE	р	
Fixed part							
Time	-0.03	0.06	0.562	-0.28	0.04	<0.001	
Time ²	0.00	0.00	0.252	0.01	0.00	<0.001	
Long COVID	0.10	0.49	0.837	1.30	0.40	0.001	
Long COVID*time	0.01	0.03	0.656	0.02	0.02	0.403	
Month of COVID infecti	on						
Mar-Apr 2020 (ref)							
Apr-May 2020	0.15	0.16	0.369	-0.68	0.35	0.051	
May-Jun 2020	-0.33	0.19	0.078	-0.84	0.36	0.021	
Jun-Jul 2020	-0.77	0.21	<0.001	-0.87	0.38	0.020	
Jul-Aug 2020	-1.24	0.23	<0.001	-1.36	0.39	0.001	
Aug-Sep 2020	-1.52	0.25	<0.001	-1.43	0.39	<0.001	
Sep-Oct 2020	-0.60	0.28	0.032	-0.80	0.40	0.044	
Oct-Nov 2020	-0.54	0.32	0.087	0.16	0.41	0.702	
Nov-Dec 2020	0.20	0.35	0.581	0.10	0.42	0.817	
Dec-Jan 2021	0.42	0.40	0.291	0.11	0.43	0.805	
Jan-Feb 2021	0.77	0.44	0.079	0.63	0.44	0.153	
Feb-Mar 2021	0.72	0.48	0.134	0.30	0.46	0.515	
Mar-Apr 2021	0.30	0.50	0.551	0.03	0.47	0.953	
Apr-Apr 2021	0.00	0.54	0.994	-0.56	0.50	0.258	
May-May 2021	0.51	0.59	0.389	0.07	0.52	0.892	
May-Jun 2021	-0.35	0.63	0.578	-0.68	0.54	0.206	
Jun-Jul 2021	-0.16	0.68	0.814	-0.34	0.56	0.543	
Jul-Aug 2021	-0.69	0.74	0.351	-0.18	0.58	0.752	
Aug-Sep 2021	0.02	0.81	0.982	-0.56	0.60	0.349	
Sep-Oct 2021	0.94	1.00	0.343	-0.36	0.62	0.557	
Oct-Nov 2021	1.17	1.37	0.395	-0.14	0.64	0.825	
Nov-Dec 2021				0.17	0.64	0.792	
Intercept	7.22	0.59	<0.001	8.36	0.46	<0.001	
Random part							
Variance of intercept							
σ_0^2	35.4	2.29		31.42	1.71		
Variance of time σ_{1}^{2}	0.08	0.01		0.04	0.01		
Covariance σ_{01}	0.80	0.12		-0.18	0.07		
Residual σ_{ϵ}^2	6.88	0.15		8.69	0.16		

NB "Month of COVID infection" represents when people contracted SARS-CoV-2 considering an individual's mental health is subject to the impact of time-related contextual factors (e.g. lockdowns and other restrictions). Depressive symptoms were lower on average after the easing of first lockdown compared to at the start of the pandemic.

Table 2. Results from growth curve model on anxiety symptoms

	Before having COVID-19			After having COVID-19				
	Coef.	SE	р	Coef.	SE	р		
Fixed part								
Time	-0.07	0.05	0.175	-0.13	0.04	<0.001		
Time ²	0.00	0.00	0.721	0.00	0.00	0.015		
Long COVID	0.53	0.42	0.204	0.52	0.36	0.145		
Long COVID*time	0.02	0.03	0.336	0.05	0.02	0.014		
Month of COVID infection								
Mar-Apr 2020 (ref)								
Apr-May 2020	-0.34	0.15	0.026	-1.08	0.30	<0.001		
May-Jun 2020	-0.81	0.17	<0.001	-1.17	0.31	<0.001		
Jun-Jul 2020	-0.93	0.19	<0.001	-0.96	0.32	0.003		
Jul-Aug 2020	-1.21	0.21	<0.001	-1.26	0.34	<0.001		
Aug-Sep 2020	-1.19	0.22	<0.001	-1.33	0.34	<0.001		
Sep-Oct 2020	-0.73	0.25	0.004	-0.59	0.35	0.089		
Oct-Nov 2020	-0.42	0.29	0.143	-0.33	0.35	0.356		
Nov-Dec 2020	-0.27	0.32	0.401	-0.47	0.37	0.198		
Dec-Jan 2021	0.33	0.36	0.364	-0.39	0.37	0.301		
Jan-Feb 2021	0.32	0.39	0.415	-0.07	0.39	0.863		
Feb-Mar 2021	0.10	0.43	0.815	-0.38	0.41	0.350		
Mar-Apr 2021	-0.04	0.45	0.929	-0.52	0.42	0.210		

Apr-Apr 2021	-0.32	0.48	0.509	-0.88	0.44	0.045
May-May 2021	0.18	0.52	0.729	-0.40	0.46	0.387
May-Jun 2021	-0.66	0.56	0.244	-0.67	0.48	0.162
Jun-Jul 2021	0.00	0.61	0.997	-0.42	0.50	0.400
Jul-Aug 2021	-0.27	0.66	0.682	-0.50	0.51	0.333
Aug-Sep 2021	0.08	0.72	0.907	-0.55	0.53	0.300
Sep-Oct 2021	0.42	0.89	0.634	-0.41	0.55	0.457
Oct-Nov 2021	-0.61	1.24	0.622	-0.36	0.57	0.527
Nov-Dec 2021				-0.01	0.57	0.987
Intercept	5.53	0.52	<0.001	6.28	0.41	<0.001
Random part						
Variance of intercept						
σ_0^2	26.3	1.69		25.69	1.39	
Variance of time $\sigma_{\text{1}}{}^{\text{2}}$	0.04	0.01		0.03	0.00	
Covariance σ_{01}	0.39	0.08		-0.18	0.05	
Residual σ_{ϵ}^2	5.96	0.13		6.44	0.12	

NB "Month of COVID infection" represents when people contracted SARS-CoV-2 considering an individual's mental health is subject to the impact of time-related contextual factors (e.g. lockdowns and other restrictions). Anxiety symptoms were lower on average after first lockdown was introduced compared to at the start of the pandemic.

Supplementary Material

Model specification:

$$Y_{ij} = \pi_{0i} + \pi_{1i}time_{ij} + \pi_{2i}time_{ij}^{2} + \varepsilon_{ij}$$
 (Eq. 1)
 $\pi_{0i} = \gamma_{00} + \gamma_{01}group_{i} + \gamma_{01}month_{i} + \zeta_{0i}$ (Eq. 2)
 $\pi_{1i} = \gamma_{10} + \gamma_{11}group_{i} + \zeta_{1i}$ (Eq. 3)
 $\pi_{2i} = \gamma_{20} + \gamma_{21}group_{i} + \zeta_{2i}$ (Eq. 4)

The growth curve model is presented mathematically in Equation (1) to (4). Equation (1) addresses intra-individual growth where Y_{ij} , depressive or anxiety symptoms for the individual i at time j, is a function of time and its quadratic term. π_{0i} represents the individual i's initial status. π_{1i} and π_{2i} represent growth rates and ε_{ij} is the residual term. Equation (2) to (4) addresses inter-individual differences in the initial status (intercept) and growth rates. γ_{00} , γ_{10} and γ_{20} represent the population average initial status (intercept) and growth rates. ζ_{0i} , ζ_{1i} and ζ_{2i} are parameter residuals.

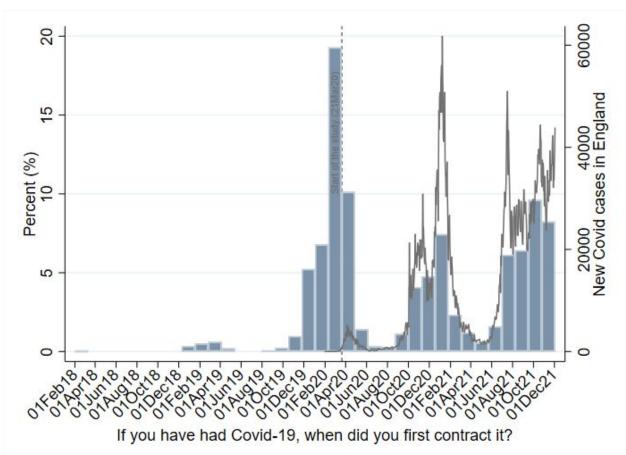


Fig S1. The date of first contract (N=4,938) compared to the national statistics of COVID-19 cases in England

Sources: COVID-19 Social Study, https://coronavirus.data.gov.uk/

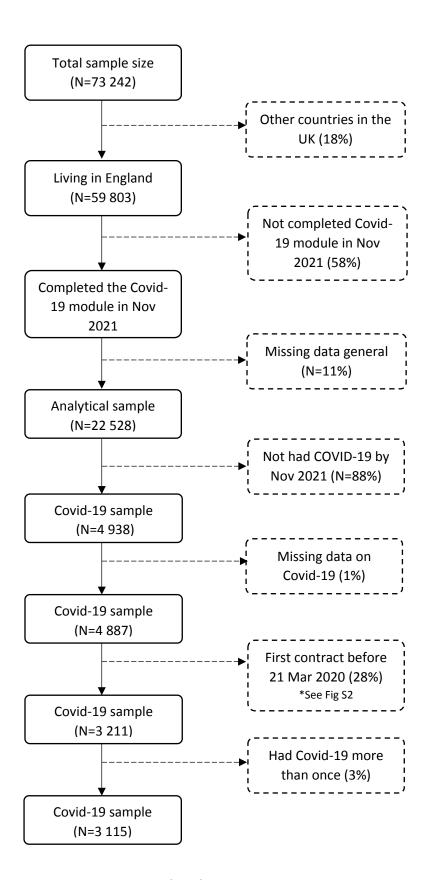


Fig S2. Sample selection process

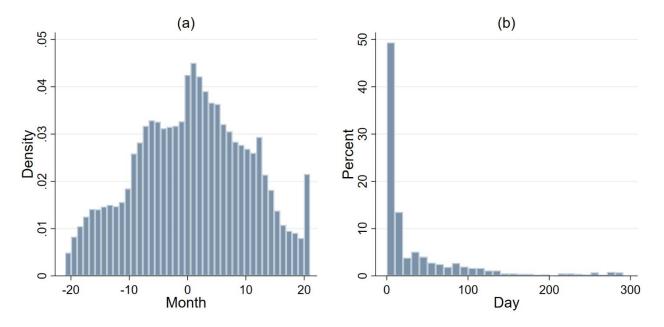


Fig S3. (a) Distribution of survey months since contracting COVID-19 in the one-to-one matched sample (total number of observations=13,325), (b) Distribution of the gap (day) between self-reported COVID-19 date and the closest survey date (either before or after, number of participants=962)

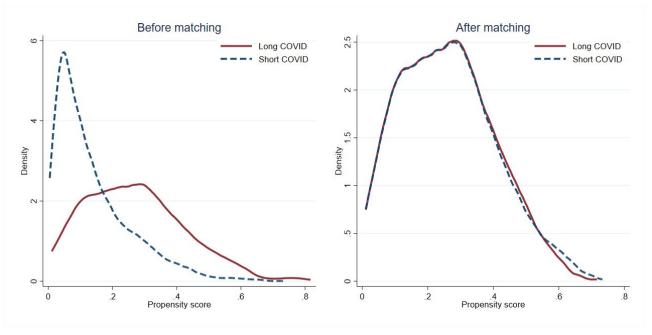


Fig S4. Propensity score density before and after matching

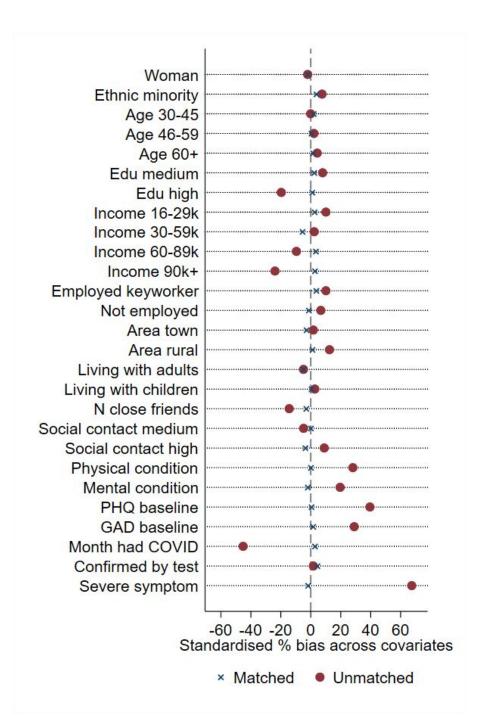


Fig S5. Standardised percentage bias for each covariate before and after matching

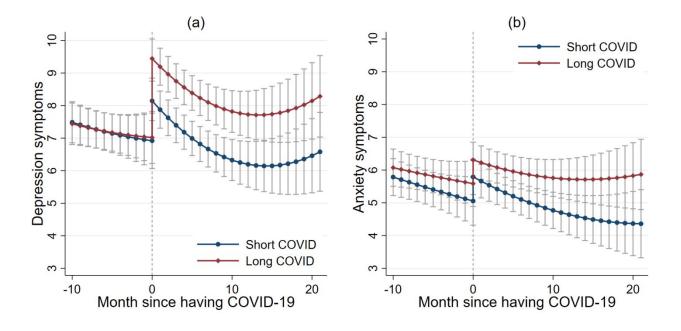


Fig S6. Predicted growth trajectories by Covid-19 group with 95% confidence intervals

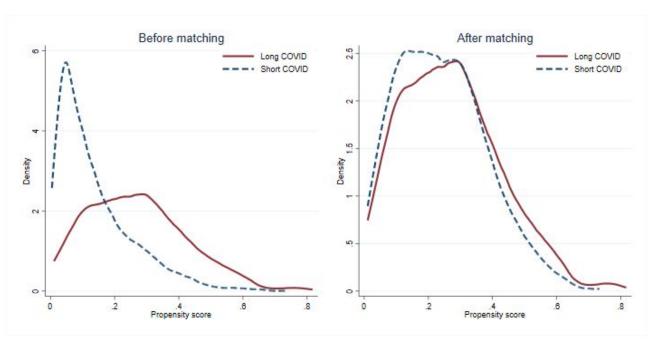


Fig S7. Propensity score density before and after matching based on one-to-many nearest neighbour matching

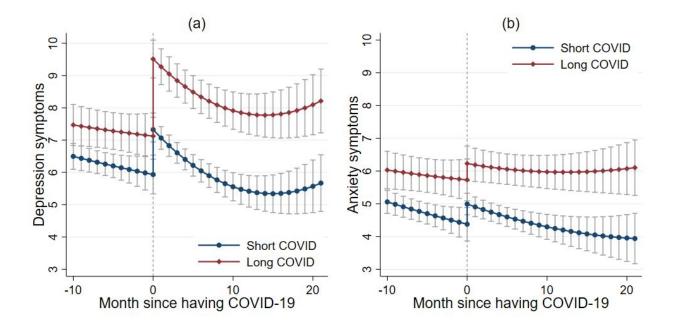


Fig S8. Predicted growth trajectories by Covid-19 group with 95% confidence intervals based on one-to-many nearest neighbour matching

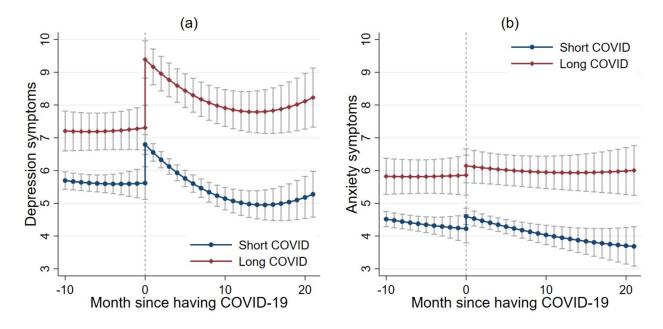


Fig S9. Predicted growth trajectories by Covid-19 group with 95% confidence intervals based on kernel matching (NB these sensitivity analyses yielded less balanced matches so apparent differences in pre-infection mental health should be interpreted with caution)

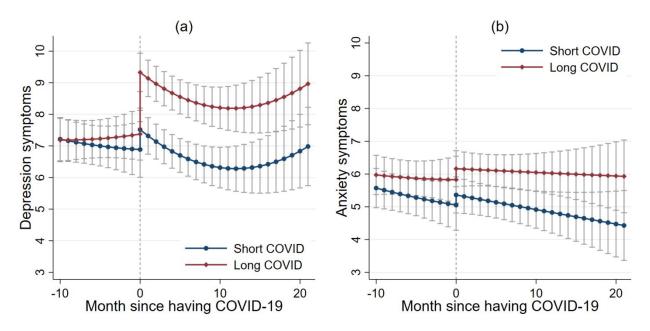


Fig S10. Predicted growth trajectories by Covid-19 group with 95% confidence intervals based on one-to-one matching excluding cases based on symptoms

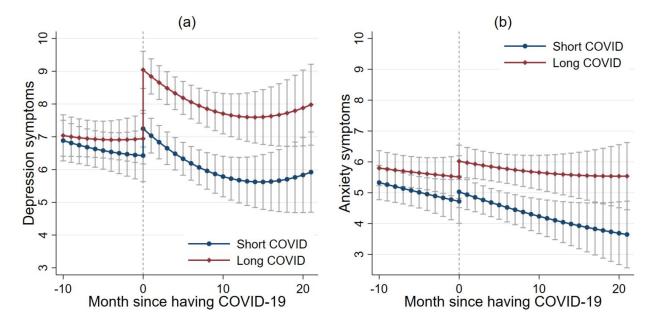


Fig S11. Predicted growth trajectories by Covid-19 group with 95% confidence intervals based on one-to-one matching excluding people who were unsure about their long Covid diagnosis

Table S1 Results from Propensity Score Matching (one-to-one matching without replacement)

	Coef.	SE	95% CI	р
Women (vs men)	-0.33	0.13	[-0.600.07]	0.013
Ethnic minority (vs white)	0.30	0.23	[-0.16-0.76]	0.197
Age 30-45 (vs 18-29)	0.48	0.24	[0.01-0.95]	0.046
Age 46-59 (vs 18-29)	0.45	0.24	[-0.01-0.91]	0.056
Age 60+ (vs 18-29)	0.64	0.26	[0.13-1.14]	0.013
Education: A levels or equivalent (vs GCSE or below)	-0.23	0.19	[-0.60-0.13]	0.208
Education: Degree or above (vs GCSE or below)	-0.40	0.16	[-0.720.09]	0.013
Income: ≤£16,000-29,999 (vs <£16,000)	-0.18	0.19	[-0.55-0.19]	0.334
Income: ≤£30,000-59,999 (vs <£16,000)	-0.25	0.19	[-0.61-0.12]	0.187
Income: ≤£60,000-89,999 (vs <£16,000)	-0.48	0.22	[-0.910.05]	0.029
Income: ≥£90,000 (vs <£16,000)	-0.93	0.26	[-1.430.42]	< 0.001
Employed, non-keyworker (vs Employed, keyworker)	0.14	0.13	[-0.11-0.39]	0.282
Not employed (vs Employed, keyworker)	-0.03	0.15	[-0.32-0.27]	0.864
Area of living: Town (vs City)	0.09	0.12	[-0.15-0.34]	0.452
Area of living: Rural (vs City)	0.51	0.15	[0.21-0.81]	0.001
Living with adult only (vs Living alone)	0.13	0.17	[-0.2-0.46]	0.444
Living with children (vs Living alone)	0.39	0.18	[0.03-0.74]	0.032
Number of close friends	-0.01	0.02	[-0.05-0.03]	0.655
Social contact: Once or twice a week (vs Twice a month or less)	-0.08	0.13	[-0.33-0.18]	0.553
Social contact: Three times a week or more (vs Twice a month or less)	-0.05	0.14	[-0.33-0.23]	0.733
Physical health condition: Yes (vs No)	0.32	0.11	[0.10-0.54]	0.004
Mental health condition Yes (vs No)	0.01	0.15	[-0.28-0.29]	0.955
Baseline depressive symptoms	0.05	0.02	[0.02-0.08]	0.002
Baseline anxiety symptoms	0.00	0.02	[-0.03-0.04]	0.885
Month had COVID-19	-0.09	0.01	[-0.110.07]	<0.001
Confirmed by testing (COVID-19 or antibody test): Yes (vs No)	0.69	0.14	[0.41-0.98]	<0.001
Severe symptoms (hospitalised or had to stay in bed): Yes (vs No)	1.37	0.13	[1.12-1.63]	<0.001
Constant	-2.47	0.41	[-3.281.66]	<0.001

Table S2 Sample characteristics by matched Covid-19 group

		Long Covid	Short Covid
		(N=481)	(N=481)
Gender	Men	21.8%	21.0%
	Women	78.2%	79.0%
Ethnicity	White	94.2%	95.0%
	Ethnic minority	5.8%	5.0%
Age group	18-29	6.0%	7.7%
	30-45	31.6%	30.8%
	46-59	39.1%	38.9%
	60+	23.3%	22.7%
Education	GCSE or below	15.4%	16.6%
	A levels or equivalent	19.5%	18.7%
	Degree or above	65.1%	64.7%
Annual income	<£16,000	14.3%	14.8%
	≤£16,000-29,999	23.7%	22.7%
	≤£30,000-59,999	38.3%	41.0%
	≤£60,000-89,999	16.2%	15.0%
	≥£90,000	7.5%	6.7%
Employment status	Employed, keyworker	39.1%	40.1%
	Employed, non-keyworker	32.6%	31.0%
	Not employed	28.3%	28.9%
Area of living	City	32.0%	31.0%
	Town	46.8%	48.2%
	Rural	21.2%	20.8%
Living status	Living alone	14.8%	12.5%
	Living with adult only	48.2%	50.7%
	Living with children	37.0%	36.8%
Social contact	Twice a month or less	35.3%	33.7%
	Once or twice a week	33.3%	33.3%
	Three times a week or more	31.4%	33.1%
Number of close friends		4.7 (3.1)	4.8 (3.1)
Physical health condition	Yes	44.1%	44.1%
•	No	55.9%	55.9%
Mental health condition	Yes	23.1%	23.9%
	No	76.9%	76.1%
Baseline depressive symptoms	110	8.3 (5.9)	8.2 (6.0)
Baseline anxiety symptoms		6.5 (5.4)	6.4 (5.2)
Month had COVID-19		10.5 (6.5)	10.3 (7.1)
Confirmed by testing (COVID-19	Yes	74.6%	72.8%
or antibody test)	No	25.4%	27.2%
Severe symptoms (hospitalised or	Yes	81.7%	82.5%
had to stay in bed)	No	18.3%	17.5%
	INU	18.3%	17.5%

Table S3. Detailed Covid experience measures by matched Covid-19 group

		Long Covid	Short Covid	Total
	Yes, a medical professional has formally diagnosed me	112		112
	with long Covid	23.3%		11.6%
	Yes, I have not been formally diagnosed but consider	369		369
Test	myself to have Long Covid No, I do not consider myself to have Long Covid	76.7% -	260	38.4% 369
	No, I do not consider myself to have long covid	_	76.7%	38.4%
	I am unsure	_	- 112	112
			23.3%	11.6%
	Total	483	L 481	962
		100%	100%	100%
	I was hospitalised	30) 16	46
		6.2%	3.3%	4.8%
	I experienced symptoms and had to rest in bed	363	381	744
		75.5%	79.2%	77.3%
C	I experienced symptoms but was able to carry on with	79	71	150
Severity (first 1-2 weeks)	daily activities	16.4%	4.8%	15.6%
(III3t 1-2 Weeks)	I was asymptomatic	g	9 13	22
		1.9%	2.7%	2.3%
	Total	483	L 481	962
		100%	100%	100%
	My symptoms were worse at the beginning (the first 1-	23	3 179	202
	2 weeks) and then got better	4.8%	37.6%	21.2%
	My symptoms were worse at the beginning (the first 1-	152	2 167	319
	2 weeks) and then mostly got better but some lingered	32.0%	35.1%	33.5%
	After the first 1-2 weeks, my symptoms got better but	67	7 21	88
	then the same symptoms kept coming back	14.19	4.4%	9.3%
	After the first 1-2 weeks, my symptoms got better but I	60) 15	75
	then developed new symptoms	12.6%	3.2%	7.9%
	Most of my symptoms lasted for 2-3 weeks	25	39	64
Symptoms		5.3%	8.2%	6.7%
	Most of my symptoms lasted for 4-12 weeks	62	2 23	85
		13.1%	4.8%	8.9%
	Most of my symptoms lasted for more than 12 weeks	83	L 6	87
		17.1%	1.3%	9.2%
	I cannot answer this question (e.g. you had COVID very	į	5 26	31
	recently)	1.1%	5.5%	3.3%
	Total	475	476	951